

# Chapter 11: Amortized Analysis

- 11.1 When the number of trees after the insertions is more than the number before.
- 11.2 Although each insertion takes roughly  $\log N$ , and each *DeleteMin* takes  $2\log N$  actual time, our accounting system is charging these particular operations as 2 for the insertion and  $3\log N - 2$  for the *DeleteMin*. The total time is still the same; this is an accounting gimmick. If the number of insertions and *DeleteMins* are roughly equivalent, then it really is just a gimmick and not very meaningful; the bound has more significance if, for instance, there are  $N$  insertions and  $O(N/\log N)$  *DeleteMins* (in which case, the total time is linear).
- 11.3 Insert the sequence  $N, N + 1, N - 1, N + 2, N - 2, N + 3, \dots, 1, 2N$  into an initially empty skew heap. The right path has  $N$  nodes, so any operation could take  $\Omega(N)$  time.
- 11.5 We implement *DecreaseKey*( $X, H$ ) as follows: If lowering the value of  $X$  creates a heap order violation, then cut  $X$  from its parent, which creates a new skew heap  $H_1$  with the new value of  $X$  as a root, and also makes the old skew heap  $H$  smaller. This operation might also increase the potential of  $H$ , but only by at most  $\log N$ . We now merge  $H$  and  $H_1$ . The total amortized time of the *Merge* is  $O(\log N)$ , so the total time of the *DecreaseKey* operation is  $O(\log N)$ .
- 11.8 For the *zig-zig* case, the actual cost is 2, and the potential change is  $R_f(X) + R_f(P) + R_f(G) - R_i(X) - R_i(P) - R_i(G)$ . This gives an amortized time bound of

$$AT_{\text{zig-zig}} = 2 + R_f(X) + R_f(P) + R_f(G) - R_i(X) - R_i(P) - R_i(G)$$

Since  $R_f(X) = R_i(G)$ , this reduces to

$$= 2 + R_f(P) + R_f(G) - R_i(X) - R_i(P)$$

Also,  $R_f(X) > R_f(P)$  and  $R_i(X) < R_i(P)$ , so

$$AT_{\text{zig-zig}} < 2 + R_f(X) + R_f(G) - 2R_i(X)$$

Since  $S_i(X) + S_f(G) < S_f(X)$ , it follows that  $R_i(X) + R_f(G) < 2R_f(X) - 2$ . Thus

$$AT_{\text{zig-zig}} < 3R_f(X) - 3R_i(X)$$

- 11.9 (a) Choose  $W(i) = 1/N$  for each item. Then for any access of node  $X$ ,  $R_f(X) = 0$ , and  $R_i(X) \geq -\log N$ , so the amortized access for each item is at most  $3\log N + 1$ , and the net potential drop over the sequence is at most  $N\log N$ , giving a bound of  $O(M\log N + M + N\log N)$ , as claimed.
- (b) Assign a weight of  $q_i/M$  to items  $i$ . Then  $R_f(X) = 0$ ,  $R_i(X) \geq \log(q_i/M)$ , so the amortized cost of accessing item  $i$  is at most  $3\log(M/q_i) + 1$ , and the theorem follows immediately.
- 11.10 (a) To merge two splay trees  $T_1$  and  $T_2$ , we access each node in the smaller tree and insert it into the larger tree. Each time a node is accessed, it joins a tree that is at least

twice as large; thus a node can be inserted  $\log N$  times. This tells us that in any sequence of  $N-1$  merges, there are at most  $N \log N$  inserts, giving a time bound of  $O(N \log^2 N)$ . This presumes that we keep track of the tree sizes. Philosophically, this is ugly since it defeats the purpose of self-adjustment.

(b) Port and Moffet [6] suggest the following algorithm: If  $T_2$  is the smaller tree, insert its root into  $T_1$ . Then recursively merge the left subtrees of  $T_1$  and  $T_2$ , and recursively merge their right subtrees. This algorithm is not analyzed; a variant in which the median of  $T_2$  is splayed to the root first is with a claim of  $O(N \log N)$  for the sequence of merges.

- 11.11 The potential function is  $c$  times the number of insertions since the last rehashing step, where  $c$  is a constant. For an insertion that doesn't require rehashing, the actual time is 1, and the potential increases by  $c$ , for a cost of  $1 + c$ .

If an insertion causes a table to be rehashed from size  $S$  to  $2S$ , then the actual cost is  $1 + dS$ , where  $dS$  represents the cost of initializing the new table and copying the old table back. A table that is rehashed when it reaches size  $S$  was last rehashed at size  $S/2$ , so  $S/2$  insertions had taken place prior to the rehash, and the initial potential was  $cS/2$ . The new potential is 0, so the potential change is  $-cS/2$ , giving an amortized bound of  $(d - c/2)S + 1$ . We choose  $c = 2d$ , and obtain an  $O(1)$  amortized bound in both cases.

- 11.12 We show that the amortized number of node splits is 1 per insertion. The potential function is the number of three-child nodes in  $T$ . If the actual number of nodes splits for an insertion is  $s$ , then the change in the potential function is at most  $1 - s$ , because each split converts a three-child node to two two-child nodes, but the parent of the last node split gains a third child (unless it is the root). Thus an insertion costs 1 node split, amortized. An  $N$  node tree has  $N$  units of potential that might be converted to actual time, so the total cost is  $O(M + N)$ . (If we start from an initially empty tree, then the bound is  $O(M)$ .)

- 11.13 (a) This problem is similar to Exercise 3.22. The first four operations are easy to implement by placing two stacks,  $S_L$  and  $S_R$ , next to each other (with bottoms touching). We can implement the fifth operation by using two more stacks,  $M_L$  and  $M_R$  (which hold minimums).

If both  $S_L$  and  $S_R$  never empty, then the operations can be implemented as follows:

*Push*( $X, D$ ): push  $X$  onto  $S_L$ ; if  $X$  is smaller than or equal to the top of  $M_L$ , push  $X$  onto  $M_L$  as well.

*Inject*( $X, D$ ): same operation as *Push*, except use  $S_R$  and  $M_R$ .

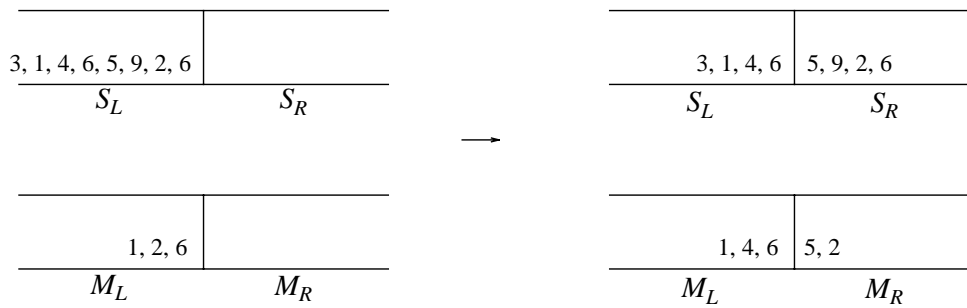
*Pop*( $D$ ): pop  $S_L$ ; if the popped item is equal to the top of  $M_L$ , then pop  $M_L$  as well.

*Eject*( $D$ ): same operation as *Pop*, except use  $S_R$  and  $M_R$ .

*FindMin*( $D$ ): return the minimum of the top of  $M_L$  and  $M_R$ .

These operations don't work if either  $S_L$  or  $S_R$  is empty. If a *Pop* or *Eject* is attempted on an empty stack, then we clear  $M_L$  and  $M_R$ . We then redistribute the elements so that half are in  $S_L$  and the rest in  $S_R$ , and adjust  $M_L$  and  $M_R$  to reflect what the state would be. We can then perform the *Pop* or *Eject* in the normal fashion. Fig. 11.1 shows a transformation.

Define the potential function to be the absolute value of the number of elements in  $S_L$  minus the number of elements in  $S_R$ . Any operation that doesn't empty  $S_L$  or  $S_R$  can



**Fig. 11.1.**

increase the potential by only 1; since the actual time for these operations is constant, so is the amortized time.

To complete the proof, we show that the cost of a reorganization is  $O(1)$  amortized time. Without loss of generality, if  $S_R$  is empty, then the actual cost of the reorganization is  $|S_L|$  units. The potential before the reorganization is  $|S_L|$ ; afterward, it is at most 1. Thus the potential change is  $1 - |S_L|$ , and the amortized bound follows.